Hydrogen economy and its production impact on automobile industry forecasting in Ecuador using principal component analysis

Joffre Espin¹, Eduardo Patricio Estevez², and Saravana Prakash Thirumuruganandham³

- ¹ Facultad de Ingeniería en Sistemas, Electrónica e Industrial, Universidad Técnica de Ambato, Ambato, Ecuador
- ² Universidade da Coruña, Grupo de Polímeros, Departamento de Física y Ciencias de la Tierra, Escuela Universitaria Politécnica, Serantes, Avda. 19 de Febrero s/n ,15471, Ferrol,Spain,
- ³ Faculty of Industrial Engineering, Centro de Investigación en Mecatrónica y Sistemas Interactivos - MIST del Instituto de Investigación, Desarrollo e Innovación, Universidad Tecnológica Indoamérica, Ambato, Ecuador.

Corresponding author: saravprak@googlemail.com,saravanaprakash@uti.edu.ec

Abstract. Hydrogen vehicles are operating in many parts of the world. However, in South America these cars are not on the streets. Even there are merchant hydrogen plants in the continent, hydrogen stations are not available vet. Doing a PCA analysis with H2 vehicle simulator framework, Principal component 1 is related with amount of storage of hydrogen. Second principal component is related with autonomy and the last principal component with raw distance. Nowadays hydrogen price is around 12 USD per kilo in Europe, and it is expensive for South America. The goal is to achieve a price of 2.15 USD in future with different renewable energies like: nuclear energy, hydro electrical, biomass and photo voltaic. Other goal is to reduce the vehicle price because the cost of a hydrogen car is 2.62 more expensive on average than a combustion car in Ecuador. One alternative to incentive the introduction of hydrogen vehicles is with taxis hydrogen vehicles like Paris is doing. Photo voltaic energy available in Tungurahua province is enough to produce hydrogen for all the taxis of the city of Ambato.

Keywords: $PCA \cdot hydrogen \cdot vehicle \cdot simulation \cdot cost$

1 Introduction

Hydrogen (H2) is the first element in the Periodic Table and the main constituent of matter in the Universe with approximately 75%. On Earth, H2 is also found in abundance, but adhered to organic components such as methane or oxygen, forming water [1]. Currently, H2 is considered an Energetic Vector like cells, batteries and all fossil fuels because it is a substance that stores energy that can be released in a controlled way later [2]. H2 as an energy vector serves as

"fuel" and it must be manufactured through the separation of the other elements because it is not found in its pure state on the planet. Because the emission result is water and electricity, H2 is considered the clean fuel of the present and future [3].

To replace fossil fuels due to the pollution to the environment that their use generates, we have chosen to use renewable energy to boost our means of transport. Such is the case that today you have electric or battery-powered motorcycles, cars, trucks, trains, boats and even aeroplanes. However, these means of transport are not found in abundance or on par with H2 as an energy source. Although H2 is commonly recognized as the fuel of the future, it does not burn like gasoline, LPG, or diesel. In reality, H2 generates energy to move an electric motor and thus obtain the movement of the vehicle. So, when talking about a hydrogen vehicle is talking about an electric vehicle, whose difference from commonly known electric vehicles is in how electricity is generated. While an H2 vehicle uses this gas to generate electricity through a fuel cell integrated with it and thus drive the engine, an electric vehicle receives the electrical charge generated in a Power Plant (solar, wind, hydro or combustion) to insert it into a battery and finally propel the vehicle.

There are various processes to manufacture H2. At an industrial level, there are grey hydrogen, blue hydrogen and green hydrogen. Gray hydrogen consists of obtaining H2 through natural gas, oil or coal, generating carbon dioxide (CO2) and carbon monoxide (CO). Steam Methane Reforming (SMR) is a pressure swing adsorption purification technology. An example of grey hydrogen is compressing methane with steam and heat, thus obtaining H2. Blue hydrogen is generated by electrolysis, which consists of separating hydrogen from oxygen in water by applying electrical energy. If in the electrolysis process the electricity comes from renewable energies such as solar, wind, water; then it is called green hydrogen. The electrolysis process loses efficiency between 20 to 30% of the energy. A feasible technology to implement in Ecuador is through residual biomass suitable for the production of bio-ethanol and thus obtain hydrogen and acetaldehyde [4]. Another potential source of hydrogen production is hydroelectricity. Just as a study has been developed on the production of H2 for an economy in Colombia, it can be developed for Ecuador since it has 27 hydroelectric plants and where an approximate waste of 50% is assumed [5], [6].

According to the Hydrogen Tools organization, in 2021 10068 Hydrogen Fueled Vehicles are operating in the US. The vehicles are subjected to the cycle mentioned during their operation. However, in South America, that kind of vehicles are not on the streets. Just a few projects or demo hydrogen cars are available in few cities. To apply hydrogen economy in the country, Ecuador has to overcome the following barriers: low and disperse investigation activity; low academic formation needed to operate and innovate on hydrogen technologies; lack of legal framework and regulations that incentive SESH penetration and incipient formation of collaborative networks in research and promotion [7].

Principal component analysis (PCA) is a technique of dimensional reduction. It means turn high dimensional data in a lower dimensional form using

sophisticated underlying mathematical principles. Possible correlated variables are into smaller variables called principal components. PCA can be applied for all topics like health: analysis of Munich Functional Developmental Diagnosis to Industry and technology: relationship between important properties of bio diesel and its chemical composition, reduction of different features of products and customers or to describe the correlation and necessity of dependent and independent variables on a research work and mathematical model [?] – [?].

The aim of this paper is to present hydrogen economy and its production for hydrogen operating vehicles in Ecuador.

- We show the merchant and captive hydrogen plants available in south America and their production capacity.
- We mention three alternatives to produce hydrogen in Ecuador based on energies: nuclear, hydro, biomass and photo voltaic.
- We run H2 Vehicle Simulation Framework with 700 bar compressed gas system as a hydrogen storage system for four different standard drive cycles.
- We apply Principal Component Analysis (PCA) to the results of H2 Vehicle Simulation Framework.
- We show a comparative of best-selling commercial hydrogen vehicles in USA and best-selling commercial combustion vehicles in Ecuador according to three main principal component analysis: storage of H2, autonomy and raw distance.
- We present an alternative to introduce hydrogen vehicles and overcome the egg hydrogen dilemma with a demand of 2055 hydrogen taxis operating in Ambato city thanks photo voltaic hydrogen production of the province.

The remainder of this paper is organized as follows: section II mentions the materials; section III describes methods applied; section IV presents the results and discussion, while section V contains the conclusions.

2 Materials

2.1 Literature

Academic articles, international organisms web pages, Ecuadorian government web pages, reviews, reports and news mentioned on references were used. Free data source excel sheets were downloaded from Hydrogen Tools organization. https://h2tools.org/. Excel sheets used are: "Asia merchant hydrogen plants Jan 2016.xlsx"; "Worldwide refinery hydrogen production capacities by country Jan 2017.xlsx"; "Worldwide refinery hydrogen production capacities by country Jan 2017.xlsx" and "US Hydrogen-Fueled Vehicles - FY21Q2.xlsx"

2.2 H2 Vehicle simulation framework configured at 700 bar storage system

H2 Vehicle Simulation Framework is a Matlab tool that simulates a light commercial vehicle with a fuel hydrogen cell (PEM) and its hydrogen storage system.

Test cases are played on the vehicle simulation framework related to the storage system. Driving conditions are associated with standard drive cycles on a specific test case. Fist case is the Ambient drive cycle or Fuel economy test. Cycles involved in it are UDDS which means low speeds in stop-and-go urban traffic and HWFET or Free-flow traffic at highway speeds. The second case is Aggressive drive using the cycle US06 for higher speeds; harder acceleration and breaking. The third case is Cold drive with FTP-45 cycle at colder ambient temperature (-20 °C). Finally, Hot drive cycle related to SC03 standard is used for hot ambient (35 °C). conditions [12]. A 700 bar compressed gas system is used as a hydrogen storage system. Because hydrogen is very light, at atmosphere pressure, transport 1 Kg of H2 would need an 11 000 Lt tank for more than 100 Km. That 's a problem. The solution, compress H2 at 700 bar to transport 4 – 5 Kg of it given 500 Km of autonomy.

2.3 Information management software: Microsoft excel and Minitab 18

Microsoft excel is used to organize numbers and data with functions and formulas. Info organized is represented on histograms as figures of this paper. Minitab 18 is a software used in high education and industry because his statistics analysis, graphics capacity, quality evaluation and experiment designer.

3 Methods

One of the most important tools on industry to represent qualitative data or quantitative data of a discrete type of variable are histograms [13]. Variables are on X axis while frequency values are on Y axis. The graphic with a surface bar is proportional to the frequency of the values presented. Figure 1 to 5 are histograms built with free data source excel sheets from Hydrogen Tools organization once information was leaked and organized with Microsoft excel software.

H2 Vehicle Simulation Framework was downloaded from the Hydrogen Materials Advanced Research Consortium organization (HyMARC) and run on Matlab R2014a [12]. A compressed 700 bar was selected on Storage System. The fuel economy test was chosen for the first test case. The second case was an aggressive cycle. The third case was the cold cycle and finally, the hot cycle. All the tests were input with 0.7 auxiliary loads and the run.

Each drive cycle has his standard and configuration. Variables result of each simulation at the end are: H2 delivered [kg], H2 used [kg], Usable H2 [kg], Storage system mass [kg], Storage system volume [L], Gravimetric capacity [%], Volumetric capacity [g/L], Temperature [°C], Pressure [bar], Raw distance [miles], On-board efficiency [%], Calculated fuel economy [mpgge] and Calculated range [miles]. Storage system mass, Store system volume and On-board efficiency were excluded for PCA.

PCA is the first step to analyses large data sets. This technique uses a transform vector to reduce dimensional and project the data in the directions of large variance [?]. Principal component analysis can be represented and applied like:

$$1st \ principal \ axis = argmax_{||a||=1} Var\left[a^{T}X\right] \tag{1}$$

$$Var\left[a^{T}X\right] = \frac{1}{n} \sum_{i=1}^{n} \left\{ a^{T} \left(X_{i} - \frac{1}{n} \sum_{j=1}^{n} X_{j}\right) \right\}^{2} = a^{T} V_{XX} a \tag{2}$$

$$V_{XX} = \frac{1}{n} \sum_{i=1}^{n} \left(X_i - \frac{1}{n} \sum_{j=1}^{n} X_j \right) \left(X_i - \frac{1}{n} \sum_{j=1}^{n} X_j \right)^T$$
 (3)

4 Results

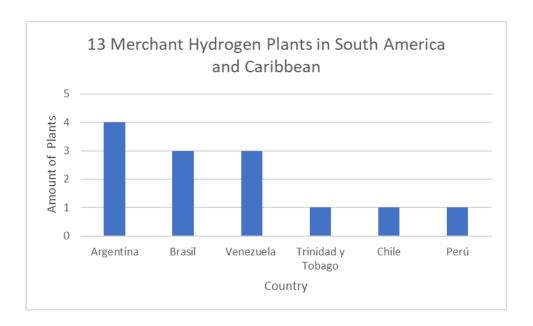


Fig. 1. Merchant Hydrogen Plants in South America and the Caribbean (2016) [15]

In the year 2016 Argentina had 4 commercial H2 production plants, three of these run by Air Liquide and one by Galileo. Two Air Liquide production companies have as their source of H2 gas production, while the other plant of the company does it for SMR. In Brazil, Air Liquide owns two Plants, one of

which is for SMR. The other Plant in that country corresponds to Air Products, producing H and CO. In Venezuela, two plants correspond to Hyundai-Wison, while the other is owned by Linde (BOC) by SMR. The production plant in Trinidad and Tobago is Air Liquide, in Chile, it is Linde (BOC) and in Peru, it corresponds to Praxair, all the latter by SMR.

According to Figure 1, Argentina, Brazil and Venezuela cover 76.92% of the number of commercial H2 production plants in South America and the Caribbean. Ecuador does not appear on the list due to the following barriers: scant and scattered research activity; minimum training offer of the human talent necessary for the operation and innovation in H2 technologies; lack of a legal and regulatory framework that encourages the penetration of the SESH and the incipient formation of collaborative networks in research and promotion [7].

To achieve an H2 economy in Ecuador, it is important to produce it in a massive, clean, safe and efficient way. An alternative is implementing a Nuclear Hydrogen Production Plant. VHTR, a Very High-Temperature Reactor, is a helium gas-cooled graphite-moderated thermal neutron spectrum reactor that can provide electricity and process heat for a wide range of applications, including hydrogen production [16]. The characteristics of said Plant and the approximate costs to it are shown below [17].

Design Parameters	Specifications
Reactor Plant	VHTR
Hydrogen Plant	SI-Based Plant
Thermal Output	4 x 600 MWth
Operating Life	60 years
Plant Availability	90%
Capacity Factor	90%
Fuel Cycle	Open

Table 1. Specification for Nuclear Hydrogen Production Plant [17]

The cost of production of 1 Kilogram of H2 would be approximately \$2.15 in the Nuclear Hydrogen Production Plant [17]. Analyzing the commercial plants available in South America and the Caribbean:

The figure above shows the different producers and their capacity for: the volume of non-condensate H2 at 1 atm pressure and 0 ° C or Normal cubic meter per hour (Nm3 / hr), thousand standard cubic feet per day (MSCF / day) and kilograms per day (Kg/day). Hyundai-Wison located in Venezuela is the Company that has the most capacity in all the exposed aspects. In the second place, regarding the capacity of Normal cubic meter per hour, there is Air Liquide, then there is Linde and finally Praxair. In second place in terms of capacity in standard cubic feet per day is Linde, followed by Air Liquide and finally Praxair. Finally, the second place regarding capacity in Kg per day is for Linde, then there is Air Liquide and finally Praxair. It should be noted that

Table 2. Summary of Costs for Nuclear Hydrogen Plant (USD M/year)[17]

Account Description	Amount (\$M/year)
Reactor Plant Capital Cost	115.7
Reactor Plant O&M Cost	73.4
Nuclear Fuel Cost	81.8
Decommissioning Cost	1.1
Total Annual Cost	272
SI Plant Capital Cost	85.1
SI Plant O&M Cost	34.8
Energy Cost	222.8
Total Annual Cost	342.7

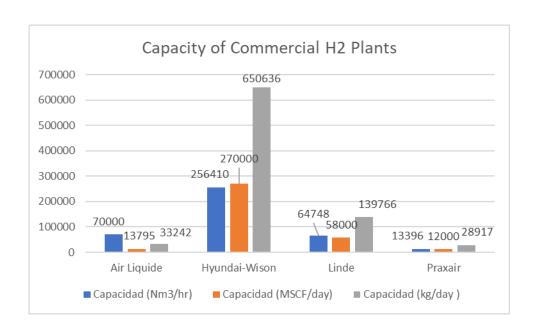


Fig. 2. Capacity of Commercial H2 Plants in South America and Caribbean (2016)[15]

Air Liquide opened in 2002, Hyundai-Wison opened in 2014, Linde in 1996 and Praxair in 2016.

Table 3. South America	Captive H2 Production Capacity at Refir	neries [18]

Country	2007	2008	2009	2010	2011	2012	2013	2014	2015	2016	2017
Argentina	19	19	19	19	19	19	19	19	19	19	19
Aruba	93	93	93	93	93	93	93	93	-	-	-
Bolivia	0	14	14	14	14	14	14	14	14	14	-
Brazil	126	126	126	126	126	126	126	126	126	126	126
Columbia	18	18	18	18	18	18	18	18	18	18	18
Venezuela	148	148	148	148	148	148	148	148	148	148	148
Total	404	418	418	418	418	418	418	418	325	325	311

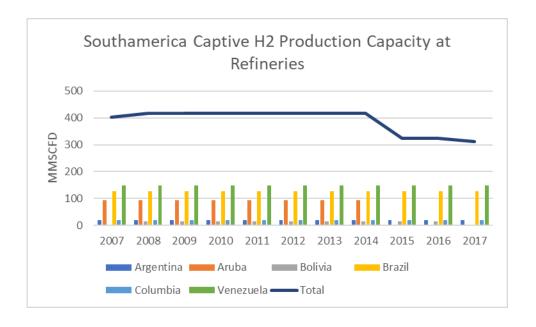


Fig. 3. South America H2 Production Capacity at Refineries (2017) [18]

The South American capacity for captive hydrogen production in refineries is shown in Figure 3 and Table 1. Captive hydrogen is the amount of H2 that the Plant produces for its consumption in million standard cubic feet per day. As with commercial H2, Venezuela ranks first in terms of captive H2 production until 2017. In second place is Brazil and in third place until 2014 Aruba. As of 2015, third place is occupied by Argentina.

H2 vehicles operating or planned to operate in the United States with an updated date of March 31, 2021, are shown in the following graph [19]:

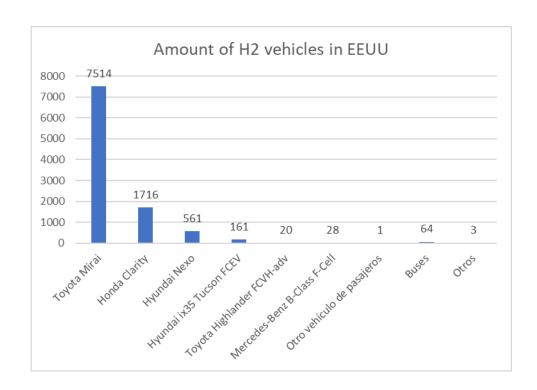


Fig. 4. Amount of H2 vehicles operating in USA (2021) [19]

The Toyota Mirai and Honda Clarity account for more than 80% of hydrogen-powered vehicles in the United States according to Fig 4.

Even though there are hydrogen-producing plants in South America, observing cars driving is not frequent. Today, different automotive companies already have a commercial hydrogen product such as Toyota with its Mirai sedan, Hyundai with the Nexo jeep or Honda with the Clarity sedan, but these are not currently available in the South American continent. The 9 existing units are demos or projects [20]. The base cost of Toyota Mirai is \$49500 in California [21], Hyundai Nexo is €72850 or \$82000 more or less [22] and Honda Clarity \$58490 [23]. In Ecuador, the best-selling vehicles in 2017 and which remain until 2020 are the Kia Sportage R jeep, the Chevrolet D-Max pick-up and the Chevrolet Sail sedan [24], [25]. The price for these cars is around \$25,990, \$29,990 and \$16,570 respectively [26]-[28].

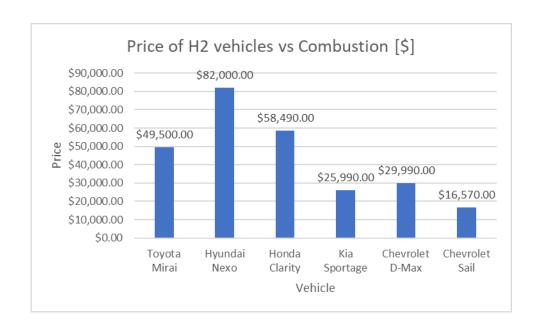


Fig. 5. Price of H2 vehicles vs Combustion [\$] (2020-2021)

Table 4. Detail of Price of H2 and combustion vehicle

Auto	Price USD	Energetic vector	Avarage Price USD
Toyota Mirai	49,500.00	Hydrogen	63,330.00
Hyundai Nexo	82,000.00	Hydrogen	
Honda Clarity	58,490.00	Hydrogen	
Kia Sportage	25,990.00	Gasoline	24,183.33
Chevrolet D-Max	29,990.00	Diesel	
Chevrolet Sail	16,570.00	Gasoline	
		Relation	2.62

According to Figure 5 and Table 2, commercial hydrogen cars not yet available in Ecuador are priced 2.62 times higher than the average price of the best-selling vehicles in the country in 2020.

Comparing the autonomy and the price of filling the tank of the Hyundai Nexo and the Kia Sportage R, the following results are obtained:

Vehículo		fuel	Relation Price/Autonomy [USD/Km]	Energetic vector
Hyundai Nexo	666	79.92	0.12	Hydrogen
Kia Sportage R	552	27.79	0.05	Gasoline
Hyundai Nexo con GHC	666	13.32	0.02	Hydrogen

Table 5. Relation Price Autonomy

Both the Hyundai Nexo and the Kia Sportage are 5-passenger Jeep-type vehicles. On the one hand, taking into account the information from the manufacturer of Nexo of 1 Kg of H2 per 100 Km and the price of the Kilo of H2 at \$12, the Price / Autonomy ratio is 0.12 \$/Km [29]. Taking advantage of the Green Hydrogen Catapult (GHC) project, the price of 1 Kg of H2 would be \$2 by 2026 and with it, the ratio drops to 0.02 \$/Km in the Hyundai Nexo [30], [31]. On the other hand, as of April 17, 2021, and with data from the manufacturer, the Kia Sportage R, with an extra gasoline price of \$1.91 per gallon, requires \$27.79 to cover the range of 552 km, obtaining a ratio of 0.05 \$/Km [26], [32].

Paris in 2015 already had 5 hydrogen taxis. In 2019 the number of taxis amounted to 100, while by 2020 600 units were expected [33], [34]. In 2018 the number of taxis registered in Ambato was 2055 units [35]. A taxi travels up to 300 km a day in 20 races consuming 10 to 12 gallons of extra gasoline. In this way, the driver of the unit has an income of \$ 40 to \$ 45 [36]. A taxi driver in Ambato if he used a hydrogen unit with GHC would obtain a daily profit of approximately \$ 38.55 versus \$ 22.08 that he obtains for using a gasoline vehicle.

Vehicle	Range	Amount	Price	Cost	Incomes	Utility
	[Km]	ener-	ener-	ener-	[USD]	[USD]
		getic	getic	getic		
		vector	vector	vector		
				[USD]		
Gasoline Taxi (gal)	300	12	1.91	22.92	45	22.08
H2 GHC Taxi (Kg)	300	3	2.15	6.45	45	38.55

Table 6. Gasoline vs. H2 Taxi Economy

Amount of hydrogen required for the circulation of 2055 taxis during a year:

```
300 \frac{km1Kg}{100Km}* 365 days * 2055 taxis = 2.2502 * 10^6 Kg
```

Tungurahua has a potential for hydrogen production from Solar Photo voltaic Energy, which in one year would be capable of producing, which is enough to cover the demand of the 2055 taxis [37].

H2 vehicles need a safe "hydro generation" and continuous supply as infrastructure for refuelling this energy vector. A viable deployment of such a refuelling infrastructure requires an initial market for vehicles, such as city taxis. Using the city's fleet of taxis as consumers, the hydrogen chicken and egg dilemma can be overcome: "What comes first: Assemble the infrastructure to lower the price and promote consumption or Consumption to accelerate the implementation of the infrastructure". In addition to meeting the objectives of ensuring the supply of hydrogen, having a city refuel the energy vector and promote the use of H2 [38].

Table 7. Summary Simulation Storage System 700 bar

N°	Detail	H2	de-	H2	Usable	Gravimet	r N c	Temperatu	Peressur	Raw dis-	Calculat	c alculated
		livere	ed	used	H2	capacity	capacity	[C]	[bar]	tance	fuel	range
		[kg]		[kg]	[kg]	[%]	[g/L]			[miles]	econ-	[miles]
											omy	
											[mpgge]	
1	Fuel Econ-	5	.67	5.67	5.67	4.8	25.3	7.5	5	464	55	311
	omy test											
	(UDDS+HWY,											
	24C)											
2	Aggressive cy-	5	.66	5.66	5.66	4.8	25.3	-6.4	6	328	58	328
	cle (US06, 24C)											
3	Cold cycle		5.4	5.4	5.4	4.5	24.1	-29.1	25	403	75	403
	(FTP-75, -20C)											
4	Hot Cycle	5	.66	5.66	5.66	4.8	25.3	19.3	6	409	72	409
	(SC03, 35C)											

Table 8. Eigenanalysis of the Correlation Matrix

Principal component (PC)	1	2	3	4	5	6	7	8	9	10
Eigenvalue	7.5763	1.3769	1.0467	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
Proportion	0.7580	0.1380	0.1050	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
Cumulative	0.7580	0.8950	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000

Variable PC2 PC3 PC4 PC5 PC6 PC7 PC8 PC9 PC10 0, 172H2 delivered [kg 0.064 -0.062 0.398 -0.333 0,707 0,236 -0,081 0.362 0.009 H2 used [kg] 0,064 -0,062 0,398 0,362 0,172-0,333|-0,707 0,236 | -0,0810,009 Usable H2 [kg] 0,362 0.064 | -0.062 | 0.3980,172 0,667 0,000 | -0,471 | -0,081 0,009 0,073 -0,095 -0,476 0,577 -0,226 Gravimetric capacity [% 0,360 0,187 0,408 0,000 -0.208Volumetric capacity [g/L] 0,073 -0,095 -0,476 -0,4080,000 -0,577 -0,226 0,360 0,187 -0,208Temperature [C 0,302 0,466 0,091 -0,079 -0,700-0,0000,000 -0,000 -0,181 0.392 Pressure [bar] -0.362-0.0610,050 0,165 -0,008 -0.0000.000 0.000 -0.912 -0,064 0,272 0,925 -0,000 0,000 0,034 Raw distance [miles] 0,015 0,224 -0,000 0,000 -0,135Calculated fuel economy [mpgge -0,2720.536 | -0.202 | -0.1130,533 0,000 0,000 0,000|-0,002|0,549Calculated range [miles 0,629 -0,250 | 0,160 -0,129 0,000 0,000 0,000 0,111 -0,660 -0,227

Table 9. Eigenvectors

The first principal component represents 75.8% of the total variation. The variables that are more correlated with Principal Component 1 (PC1) are: H2 delivered (0.362), H2 used (0.362), Usable H2 (0.362), Pressure (-0.362), Gravimetric capacity [%] (0.360) and Volumetric capacity [g/L] (0.360). PC1 has a positive correlation with the first three variables and the last two. However, it has a negative correlation with Pressure. So, increase the values of H2 delivered, H2 used, Usable H2, Gravimetric capacity and Volumetric capacity will increase the value of the first principal component. But, increase the value of Pressure will decrease the value of PC1.

The first three components have an Eigenvalue of more than 1. According to Kaiser criterion, components with a value of more than 1 are used as Principal Components. The first three principal components explain 100% of the variation of the data. So, PC1, PC2, PC3 are used. Also, the Scee plot shows that Eigenvalues form a straight line after the third principal component. Results show that principal component 1 has a positive association with H2 delivered, H2 used, Usable H2, Gravimetric capacity and Volumetric capacity, but a negative association with Pressure. Five positive PC1 are the amount of H2 before, while and after a hydrogen vehicle function. The second principal component is associated with Calculated fuel economy and calculated range. So, this component measures the autonomy of the vehicle. Finally, the third principal component is Raw distance.

The loading plot shows the variables that are heavier on each component. Influences approaching -1 or 1 indicate that the variable significantly affects the component. Influences close to 0 means that the variable has a low influence on the component. In Figure 7, Volumetric capacity, H2 used, Usable H2, Gravimetric capacity and H2 delivered have a positive influence on component one. Pressure has a negative influence on PC 1. Calculated fuel economy and Calculated range have a strong positive influence on principal component 2. It means autonomy of the vehicle, an important factor now to decide which car to buy.

Figures 8, 9 and 10 represent a contrast the three principal components to each other. Values close to 1 are strong correlated. A point on the corners of the

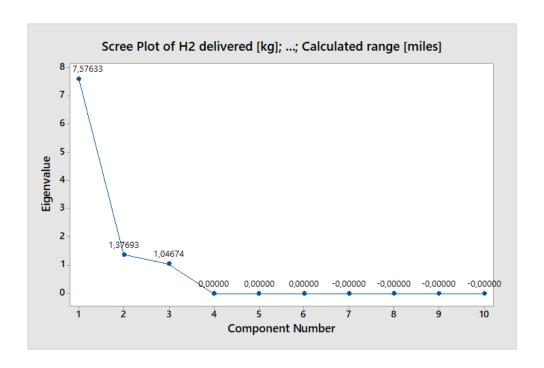


Fig. 6. Scree plot

Table 10. Eigenvectors for PC

Variable	PC1	PC2	PC3
H2 delivered [kg]	0.362	0.064	-0.062
H2 used [kg]	0.362	0.064	
Usable H2 [kg]	0.362	0.064	-0.062
Gravimetric capacity [%]	0.360	0.073	-0.095
Volumetric capacity [g/L]	0.360	0.073	-0.095
Temperature [C]	0.302	0.466	0.091
Pressure [bar]	-0.362	-0.061	0.050
Raw distance [miles]	0.015	0.272	0.925
Calculated fuel economy [mpgge]	-0.272	0.536	-0.202
Calculated range [miles]	-0.227	0.629	-0.250

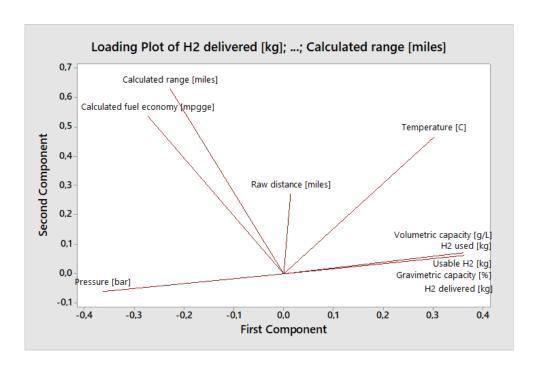


Fig. 7. Loading Plot

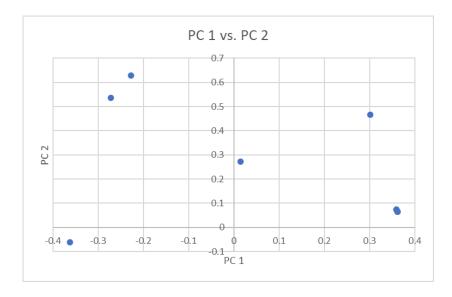


Fig. 8. PC 1 vs PC 2

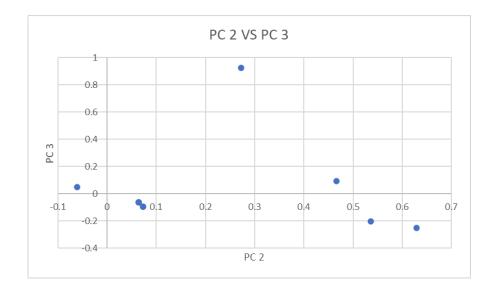
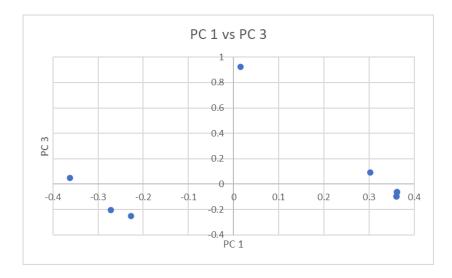


Fig. 9. PC 2 vs PC 3



 $\textbf{Fig. 10.} \ \mathrm{PC} \ 1 \ \mathrm{vs} \ \mathrm{PC} \ 3$

graphs is expected for a strong correlation between both principal components. Points close to X axis and 1 value means that a strong relation only with that principal component. The same happened with Y axis.

5 Conclusion

- 1. Ecuador has the potential to produce hydrogen through biomass and photovoltaic solar energy despite the different current barriers. Similarly, the possibility of implementing a Nuclear Plant to produce H2. The goal is the cost of \$ 2.15 per kilogram of hydrogen.
- 2. The hydrogen vehicle, Toyota Mirai, is the most accessible car for the implementation of this technology in the country due to its price. Commercial hydrogen cars not yet available in Ecuador are priced 2.62 times higher than the average price of the best-selling vehicles in the country in 2020.
- 3. The comparison of the Hyundai Nexo to H2 with the gasoline-powered Kia Sportage shows that if the first car circulated in Ecuador, it would have a Price-Range ratio of \$ 0.12 / km compared to \$ 0.05 / km of the second car. However, if one of the advantages of the Green Hydrogen Catapult project were applied, the ratio would be more favourable for the Hyundai Nexo with 0.02 \$ / Km.
- 4. The profit that a taxi driver would have after a workday of 8 to 10 hours travelling 300 km approximately is \$ 22.08 using a gasoline vehicle at \$ 38.55 if using a hydrogen vehicle and with the advantage of the Green Hydrogen Catapult project or the Implementation of the Nuclear Plant.
- 5. The photo voltaic solar energy that is generated in the Province of Tungurahua would cover the demand of 2,055 city taxis in the city of Ambato. Furthermore, with the hydrogen-powered taxi fleet, the hydrogen chicken and Egg dilemma can be broken.
- 6. H2 Vehicle Simulation Framework is a three-dimensional scale that assesses the H2 amount of the vehicle, the autonomy of the car and raw distance. This dimension will be important at the moment to buy an H2 vehicle.
- 7. A strong correlation between two principal components can be appreciate on a graph where a point of X and Y axis should be in the corner because the values will be close to 1.

6 Acknowledgements

Authors have no conflict of interest. Mr.Joffre Espin, Mr.Eduardo Estevez thank for research support of the seed grant "Computational modelling of materials and machine learning algorithms, Universidad Technologica IndoAmerica, Ecuador", awarded to S.P.T

7 Source

https://github.com/joffreespin/PaperH2

References

- J. A. Ramírez-Samperio, "Las cinco formas más elegantes de morir en el Universo," vol. 1, no. 1, 2019, doi: https://doi.org/10.29057/h.v1i1.4777.
- 2. R. Aguado, J.-L. Casteleiro-Roca, E. Jove, F. Zayas-Gato, H. Quintián, and J. L. Calvo-Rolle, "Hidrógeno y su almacenamiento: el futuro de la energía eléctrica," 2021, doi: https://doi.org/10.17979/spudc.9788497497985.
- 3. C. Fúnez Guerra, E. Almasa Rodríguez, and D. Fuentes Ferrara, El hidrógeno: vector energético del futuro. 2010.
- 4. C. Donoso Quimbita, V. Ortiz Bustamante, B. Amón De La Guerra, and R. Herrera Albarracín, "Diseño de un reactor continuo para la producción de hidrógeno y acetaldehído a partir de etanol en Ecuador," UTCiencia, vol. 5, no. 1, pp. 30–40, 2018.
- H. Carvajal Osorio, J. Babativa, and J. Alonso, "Estudio sobre producción de H con hidroelectricidad 2 para una economía de hidrógeno en Colombia," Ing. y Compet., vol. 12, no. 1, pp. 31–42, 2010.
- 6. A. García Nieto, Centrales hidroeléctricas en Ecuador. 2018.
- F. Posso Rivera and J. Sánchez Quezada, "La Economía del Hidrógeno en el Ecuador: oportunidades y barreras," Av. Cienc. Ing., vol. 6, no. 2, 2014, doi: https://doi.org/10.18272/aci.v6i2.187.
- 8. G. Pazera, M. Młodawska, J. Młodawski, and K. Klimowska, "Principal Component Analysis of Munich Functional Developmental Diagnosis," Pediatr. Rep., vol. 13, pp. 227–233, 2021, doi: https://doi.org/ 10.3390/pediatric13020031.
- M. I. Jahirul et al., "Investigation of correlation between chemical composition and properties of biodiesel using principal component analysis (PCA) and artificial neural network (ANN)," Renew. Energy, vol. 168, pp. 632–646, 2021, doi: https://doi.org/10.1016/j.renene.2020.12.078.
- 10. S. Bandyopadhyay, S. S. Thakur, and J. K. Mandal, "Product recommendation for e-commerce business by applying principal component analysis (PCA) and K-means clustering: benefit for the society," Innov. Syst Softw Eng, vol. 17, pp. 45–52, 2021, doi: https://doi.org/10.1007/s11334-020-00372-5.
- 11. H. Patil and A. Dwivedi, "Prediction of properties of the cement incorporated with nanoparticles by principal component analysis (PCA) and response surface regression (RSR)," Mater. Today Proceedings, vol. 43, no. 2, pp. 1358–1367, 2021, doi: https://doi.org/10.1016/j.matpr.2020.09.170.
- 12. HyMARC, "Hydrogen Storage Systems Modeling." https://www.hymarc.org/models.html.
- 13. S. Kalaivani, S. P. Shantharajah, and T. Padma, "Agricultural leaf blight disease segmentation using indices based histogram intensity segmentation approach," pp. 9145–9159, 2020, doi: https://doi.org/10.1007/s11042-018-7126-7.
- V. Gray, Principal Component Analysis: Methods, Applications and Technology. 2017.
- 15. Hydrogen Tools, "Merchant Hydrogen Plants," 2016. https://h2tools.org/hydrogen-data/merchant-hydrogen-plant-capacities-
- 16. S. Deokattey, K. Bhanumurthy, P. K. Vijayan, and I. V. Dulera, "Hydrogen production using high temperature reactors: an overview," Techno Press, vol. 1, no. 1, pp. 013–033, 2013, doi: http://dx.doi.org/10.12989/eri.2013.1.1.013.
- 17. J. Kim, K. Lee, and M. Kim, "Calculation of LUEC using HEEP Software for Nuclear Hydrogen Production Plant," Trans. Korean Nucl. Soc. Spring Meet. Jeju, Korea, vol. 47, no. 8, 2015.

- 18. HydrogenTools, "Worldwide Refinery Hydrogen Production Capacities," 2017. https://h2tools.org/hyarc/hydrogen-data/refinery-hydrogen-production-capacities-country.
- 19. HydrogenTools, "US Hydrogen-Fueled Vehicles," 2021. https://h2tools.org/hyarc/hydrogen-data/inventory-us-over-road-hydrogen-powered-vehicles (accessed Apr. 17, 2021).
- 20. HydrogenTools, "International Hydrogen Fueled Vehicles," 2021. https://h2tools.org/hydrogen-data/inventory-international-over-road-hydrogen-powered-vehicles (accessed Apr. 17, 2021).
- 21. Toyota, "Mirai 2021," 2021. https://www.toyota.com/espanol/mirai/ (accessed Apr. 17, 2021).
- Hyundai, "Nexo," 2021. https://www.hyundai.com/es/modelos/nexo.html (accessed Apr. 17, 2021).
- 23. Edmunds, "2021 Honda Clarity Electric (fuel Cell)," 2021. https://www.edmunds.com/honda/clarity/2021/electric-fuel-cell/ (accessed Apr. 17, 2021).
- 24. J. L. Ulloa Masache and A. F. Velasco Vicuña, "Evaluación del consumo de combustible en vehículos, utilizando diferentes estrategias cambios de marcha," Universidad del Azuay, 2018.
- 25. El "Cuáles Universo, sidohan los car-2020," preferidos 2020. ros en Ecuador en Motores, https://www.eluniverso.com/entretenimiento/2020/11/24/nota/8060893/cualeshan-sido-10-carros-preferidos-ecuador-2020/ (accessed Apr. 17, 2021).
- Chevrolet, "Sail," 2021. https://www.chevrolet.com.ec/autos/sail-sedan (accessed Apr. 17, 2021).
- Kia, "Sportage R," 2021. https://www.kia.com/ec/showroom/sportage-r.html (accessed Apr. 17, 2021).
- 28. Chevrolet, "D-Max," 2021. https://www.chevrolet.com.ec/pick-ups/dmax-hi-ride-pick-up (accessed Apr. 17, 2021).
- 29. Motor.es, "El hidrógeno en los coches: ventajas e inconvenientes," 2021. https://www.motor.es/que-es/hidrogeno: :text=Así%2C el kilo de hidrógeno,%2C9 kg%2F100 km. (accessed Apr. 30, 2021).
- 30. Hyundai, "Todo sobre Hyundai NEXO," 2021. https://www.hyundai.com/es/zonaeco/eco-drive/modelos/todo-sobre-hyundai-nexo-primer-coche-hidrogeno-espana: :text=El Hyundai NEXO dispone de,%2C2 litros cada uno). (accessed Apr. 17, 2021).
- 31. United Nations Framework Convention on Climate Change, "Green Hydrogen Catapult," 2020. https://racetozero.unfccc.int/green-hydrogen-catapult/ (accessed Apr. 17, 2021).
- 32. Petroecuador, "Precios de venta de combustibles," 2021. https://www.eppetroecuador.ec/?p=8062 (accessed Apr. 17, 2021).
- 33. La Vanguardia, "El hidrógeno alimenta nuevos taxis en París," 2015. https://www.lavanguardia.com/motor/tendencias/20151210/30714240786/hyundai-ix35-fuel-cell-taxi-hidrogeno-paris.html (accessed May 01, 2021).
- 34. FuelCellWorks, "Taking a Taxi in Paris: Now with Hydrogen!," 2019. https://fuelcellsworks.com/news/taking-a-taxi-in-paris-now-with-hydrogen/ (accessed May 01, 2021).
- 35. El Heraldo, "Matriculados 24.063 vehículos en Ambato," 2018. https://www.elheraldo.com.ec/matriculados-24-063-vehiculos-en-ambato/ (accessed May 01, 2021).

- 36. El Comercio, "Costos operativos de taxis se ajustarán con el subsidio," 2019. https://www.elcomercio.com/actualidad/taxis-subsidio-costos-operativos-gasolina.html: :text=Mera calcula que un taxi,una utilidad de hasta 25. (accessed May 01, 2021).
- 37. F. R. Posso, J. P. Sánchez, and J. Siguencia, "Estimación del Potencial de Producción de Hidrógeno a partir de Energía Solar Fotovoltaica en Ecuador," Rev. Técnica "energía"., no. 12, pp. 373–378, 2016.
- 38. S. Campíñez Romero, A. Colmenar Santos, C. Pérez Molina, and F. Mur Pérez, "A hydrogen refuelling stations infrastructure deployment for cities supported on fuel cell taxi roll-out," Elsevier, vol. 148, pp. 1018–1031, 2018, doi: https://doi.org/10.1016/j.energy.2018.02.009.